# An Investigation of How Horse Racing Experts Make Poor Decisions 

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## presenter information

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## our research interest

- communications in SNS
- user behavior analysis
- trust and security in SNS


## background

## statistical studies showed that even experts made poor decisions



## "fly-ball revolution" [Sawchik 2017]



## statistical research

Which is better:
fly-balls, or grounders?

## What we learned

even experts made poor decisions

## A new question

how and why
experts made poor decisions?

## A new question

how and why experts made poor decisions?

Research target
horse racing experts
(horse owners and trainers)


## horse racing experts' purposes

win races and get the prize money
their tactics ( race selection)

- select races that are likely to have good outcomes
- not select races that are likely to have poor outcomes


## Our reseach purpose

how horse racing experts make poor decisions in race selection
two ways they can make poor decisions: - they do not select races that are likely to have good outcomes

- they select races that are likely to have poor outcomes
which way? or both ways?


## horse racing experts' belief in selecting races

Many horse racing experts often say
a sire line can indicate the potential abilities of a horse (e.g. which distance races the horse is good at)
sire line: paternal lineage or ancestry of a horse

## Our approach

we focus on

- sire line,

- race distance, and
- order of finish
and compare
- experts' race selections
- race results
by using statistical analysis


## prize money

 in Japan Racing Association (JRA)Horse owners get prize money when their horses finish within fifth place.



## our obtained data of racehorses

36869 horses registered with JRA from 2010 to 2017

| Year | \# of <br> horses |
| ---: | ---: |
| 2010 | 4470 |
| 2011 | 4524 |
| 2012 | 4505 |
| 2013 | 4595 |
| 2014 | 4649 |
| 2015 | 4663 |
| 2016 | 4370 |
| 2017 | 4733 |
| Total | 36869 |

## \# of horses classified into three famous sire lines

| sire line | \# of horses |
| :--- | ---: |
| Native Dancer Line | 8777 |
| Nearctic Line | 6374 |
| Royal Charger Line | 18077 |
| others $\quad 3641$ |  |
| Total |  |

(Note) We grouped many kinds of branched sire lines into four kinds above

## \# of times the 36869 horses had competed in

| race distance | \# of races |
| :---: | ---: |
| $1000--1399 m$ | 89246 |
| $1400--1799 m$ | 123163 |
| $1800-2199 m$ | 120251 |
| $2200--2799 m$ | 19029 |
| 2800 m -- | 7920 |
| Total | 359609 |

\# of times the 36869 horses of four sire lines had competed in races of various distances

## race distance

| sire line | $\begin{aligned} & 1000-- \\ & 1399 \mathrm{~m} \end{aligned}$ | $\begin{aligned} & 1400-- \\ & 1799 \mathrm{~m} \end{aligned}$ | $\begin{gathered} 1800-- \\ 2199 \mathrm{~m} \end{gathered}$ | $\begin{aligned} & \hline 2200-- \\ & 2799 \mathrm{~m} \end{aligned}$ | $2800 \mathrm{~m}$ | Total |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Native Dancer | 24264 | 28895 | 25762 | 3474 | 1767 | 84162 |
| Nearctic | 17228 | 20917 | 18728 | 2589 | 1240 | 60702 |
| Royal Charger | 38426 | 62123 | 65782 | 11294 | 4252 | 181877 |
| others | 9328 | 11228 | 9979 | 1672 | 661 | 32868 |
| Total | 89246 | 123163 | 120251 | 19029 | 7920 | 359609 |

\# of times the 36869 horses of four sire lines had finished in first place in races of various distances
race distance

| sire line | $\begin{aligned} & \hline 1000-- \\ & 1399 \mathrm{~m} \end{aligned}$ | $\begin{aligned} & 1400-- \\ & 1799 \mathrm{~m} \end{aligned}$ | $\begin{gathered} \hline 1800-- \\ 2199 \mathrm{~m} \end{gathered}$ | $\begin{aligned} & \hline 2200-- \\ & 2799 \mathrm{~m} \end{aligned}$ | $2800 \mathrm{~m}$ | Total |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Native Dancer | 1993 | 2329 | 2152 | 348 | 215 | 7037 |
| Nearctic | 1377 | 1598 | 1478 | 226 | 154 | 4833 |
| Royal Charger | 2606 | 4924 | 5567 | 1061 | 545 | 14703 |
| others | 715 | 866 | 675 | 120 | 74 | 2450 |
| Total | 6691 | 9717 | 9872 | 1755 | 988 | 29023 |

\# of times the 36869 horses of four sire lines had finished within fifth place in races of various distances
race distance

| sire line | $\begin{aligned} & 1000-- \\ & 1399 \mathrm{~m} \end{aligned}$ | $\begin{aligned} & 1400-- \\ & 1799 \mathrm{~m} \end{aligned}$ | $\begin{gathered} 1800-- \\ 2199 \mathrm{~m} \end{gathered}$ | $\begin{aligned} & \hline 2200-- \\ & 2799 \mathrm{~m} \end{aligned}$ | $2800 \mathrm{~m}$ | Total |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Native Dancer | 8691 | 10322 | 9783 | 1498 | 776 | 31070 |
| Nearctic | 6120 | 7414 | 6861 | 989 | 513 | 21897 |
| Royal Charger | 12878 | 22677 | 25338 | 4603 | 1926 | 67422 |
| others | 3127 | 3854 | 3368 | 646 | 262 | 11257 |
| Total | 30816 | 44267 | 45350 | 7736 | 3477 | 131646 |

(Note) horses within fifth place get prize money in the JRA races

## statistical analysis of experts' poor decisions

we focus on
sire line, race distance, and order of finish
and compare

- experts' race selections
- race results
by using two-sided binomial test and detect cases with large differences


## two-sided binomial test on experts' selections by using Hypothesis ES

## Hypothesis ES

\# of times horses were entered into races of distance $d_{\mathrm{j}}$
\# of times horses were entered into races
\# of times
horses of sire line $S_{i}$ were entered into races of distance $d_{\mathrm{j}}$
probability: an expert enters his/her horse into a race of distance $d_{j}$

## two-sided binomial test on race results by using Hypothesis RR

## Hypothesis RR

\# of times horses finished within rank-th place in races of distance $d_{\mathrm{j}}$
\# of times horses were entered into races of distance $d_{j}$
\# of times
horses of sire line $S_{i}$ were entered into races of distance $d_{\mathrm{j}}$ probability: a horse finished within rank-th place into a race of distance $d_{j}$

## how to read graphs of experts' selections vs race results



## experts' selections vs race results Native Dancer Line


first place

within fifth place

## experts' selections vs race results

## Nearctic Line


first place


## within fifth place

## experts' selections vs race results Royal Charger Line



## first place


within fifth place

How to detect cases of experts' poor decisions (1/5)

1. We calculate the p-value of

- experts' race selections
two-sided binomial test
- race results
by applying Hypothesis ES and RR on 15 combinations of
sire lines

| Native Dancer Line |
| :--- |
| Nearctic Line |
| Royal Charger Line |

X
1000-1399m
1400-1799m
race distances
2200-2799m
2800m -

## How to detect cases of experts' poor decisions (2/5)

2. By using the p-value of experts' selections (ES), we found

- 5 cases ( $p$-value of $E S>0.975$ ) experts strongly thought they were favorable to win races
- 7 cases ( $p$-value of $E S<0.025$ ) experts strongly thought they were unfavorable to win races


## two-sided binomial test significance levels 0.05

We classified these 12 cases into $\cdots$

## How to detect cases of experts' poor decisions $(3 / 5)$

3. Focused on the difference between the p-values of experts' selections and race results, we classified the 12 cases into

- 8 cases (the difference were small) plotted at the upper right or the lower left of the graphs
- 2 cases (the difference were large) plotted at the upper left or the lower right of the graphs
- 2 other cases


## How to detect cases of experts' poor decisions (4/5)

large difference between the p-values of experts'selections and race results

## experts' poor decisions

- Native Dancer Line (1800-2199m)
- Native Dancer Line (2200-2799m)

How to detect cases of experts' poor decisions (5/5)



Both cases were plotted at the upper left of the graphs

## How horse racing experts make poor decisions (1/2)

## Both cases were plotted at the upper left of the graphs

- Native Dancer Line (1800-2199m)
- Native Dancer Line (2200-2799m)
- Experts selected these cases too few times
$>$ experts strongly thought these cases were unfavorable to win rases
- The race results showed these cases were favorable to win races

How horse racing experts make poor decisions (2/2)
Two ways horse racing experts can make poor decisions on race selections

- experts do not select races that are likely to have good outcomes
- experts select races that are likely to have poor outcomes
which way?
or both ways?

Conclusion
horse racing experts made poor decisions by not selecting races that are likely to have good outcomes

Why horse racing experts make poor decisions? (1/2)
horse racing experts made their poor decisions

- by not selecting races that are likely to have good outcomes
- not by selecting races that are likely to have poor outcomes

We think it is because
people are more sensitive to risks than opportunities

## Why horse racing experts make poor decisions? (2/2)

## people are more sensitive to risks than opportunities

- when people lose at something they thought they could win, they carefully consider the consequences
- when people win something they thought they would lose, they, even experts, do not carefully consider the consequences

It is difficult to update knowledge and experiences using good results

## Future works

To generalize this finding, we intend to

- analyze race performance data in other countries
- compare the results with those obtained in this study

